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Zero-knowledge decision making: Cause is the effect of effect, effect is the cause of cause

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Abstract

A zero-knowledge decision making (ZKDM) method is proposed, and checked for correctness. For a certain kind of decision event, the decision maker does not know the internal mechanism and knowledge information of the decision event. By defining the feature points and feature sets of the selection branches of the decision event, the characteristic moments of the system are constructed and the correct branch is obtained. It is observed that the cases of arriving at the correct choice based on the ZKDM method have a certain universality. The effective mechanism of the ZKDM method may be related to the fact that the designers of decision events usually determine the correct selection branch first, before changing it to design other branches. A questionnaire survey of 279 respondents revealed that more than half of them adopted such a design idea. Furthermore, a separate questionnaire survey of 465 decision-makers, reveal that 19.14% of the respondents clearly adopted ZKDM.

Keywords: Zero-knowledge decision making (ZKDM); characteristic moment; questionnaire investigation

1 Introduction

Decision making is often a black-box, but remains a key feature in many real-world scenarios. Decision making often involve mechanisms and causation to choose the best action available among the presented options. Human decision making can be modelled from the computational perspective. This is often dependent on implied theories and resource constraints. Traditionally, algorithms are believed to be the saving grace to the limitations of human judgement in decision making [1, 2]. For example, computational complexity theory provides a way for modelling and quantifying human decision making as a function of computational complexity [3]. Other methods include the entropy weight method which places weights on certain options to accurately reflect the amount of information provided by each option, while limiting the interference of human factors. This is advantageous as it presents the decision event independently from the characteristics of the decision maker [4]. Since the advent of computers, algorithmic decision-making models have taken the forefront in research to examine factors that influence individual and organisational decisions [5, 6].

The nature of the decision events widely demands different decision-making algorithms. In particular, for single-agent selection problems, there is a need to computationally represent each option, place weight on priorities, and consistency in measuring options; these can be extended to multi-criteria decision making, commonly known as Analytic Hierarchy Process [7], and often involve fuzzy set theory. These often require comprehensive fore-knowledge of the decision space, which is formed by the overlap of multiple decision variables, leading to the emerging use of fuzzy logic in multi criteria problems [8, 9, 10]. Often, decision-makers assign variable weights to synthesise measures to risks on certain options, especially in multi-attribute decision making scenarios [11].

In special cases of decision events, it is possible for a decision maker to arrive at a choice without having fore-knowledge of the decision event. However, to the best knowledge of the authors, there has not been any research to model such zero-knowledge decision events. This motivates the investigation in this paper.

23 Consider the following example in the form of a multiple-choice question: Which of the following, from Fig. 1,
 is the actual Chinese social media and multipurpose application WeChat logo? There are three main ways in which



Figure 1: Section branches of the WeChat logo, of which one is the actual logo, with three other wrong possible choices.

24 decision-makers can arrive at the correct choice: (i) they remember (or have a former impression of) the WeChat
 25 logo; (ii) they choose at will and randomly chose the right option; or (iii) after careful observation of the options,
 26 they use a certain method of analysis to arrive at the correct choice. Here, the third type of decision-makers, which
 27 employ the method of observation, thinking and selection is of interest. One such method named zero-knowledge
 28 decision making (ZKDM) may be adopted in this instance.
 29

30 1.1 Zero-knowledge decision making framework

31 For a certain kind of decision events, the decision-maker, without knowing the internal mechanism and knowledge
 32 information of the event, can make a correct decision inferred from the alternative branches provided by the event
 33 designer—this is ZKDM.

34 Suppose that a decision event D has n alternative branches. There are $m > 1$ types of feature points to effectively
 35 distinguish n alternative branches; among which the selection of feature points includes words, numbers, graphics,
 36 attributes, symbols, locations, categories, etc. The feature set $\mathbf{C}_i = (C_{1i}, C_{2i}, \dots, C_{ni})$, $i = 1, 2, \dots, m$ is defined as
 37 the representation of n selection branches at the i -th feature point. For the feature set \mathbf{C}_i , the characteristic moment
 38 of the selection branch j on the feature point i is defined as

$$L_{ji} = \sum_{k=1, k \neq j}^n l_{jk}, \quad j = 1, 2, \dots, n; \quad i = 1, 2, \dots, m, \quad (1)$$

39 where

$$\begin{cases} l_{jk} = 0 & \text{if } C_{ji} = C_{ki} \\ l_{jk} = 1 & \text{if } C_{ji} \neq C_{ki} \end{cases}. \quad (2)$$

40 The system characteristic moment of the selection branch j at all m types of feature points is

$$L_j = \sum_{i=1}^m l_{ji}, \quad j = 1, 2, \dots, n. \quad (3)$$

41 The corresponding unique branch given by $\min(L_1, L_2, \dots, L_n)$, is the selection result based on the ZKDM method.

42 The events that can make use of the ZKDM method need to satisfy the following three conditions:

- 43 (1) The event designers need to provide a finite number of n options, including the correct one. Further, the branches
44 are different from each other, that is, any two branches j and k , $j, k \in \{1, 2, \dots, n\}, j \neq k$, there is at least one
45 characteristic point i , satisfying $C_{ji} \neq C_{ki}$, $i \in \{1, 2, \dots, m\}$.
- 46 (2) The m , $m > 1$, types of feature points can be set to effectively distinguish n selection branches provided by the
47 event designer. m is necessarily greater than 1. If $m = 1$, in order to realize the effective differentiation of n selec-
48 tion branches on this unique feature point, the elements in the set $\mathbf{C}_1 = (C_{11}, C_{21}, \dots, C_{n1})$ must be completely
49 inconsistent (different from each other). Hence the system characteristic moment $L_1 = L_2 = \dots = L_n = n - 1$
50 of all selection branches leads to the non-uniqueness of the corresponding branches of $\min(L_1, L_2, \dots, L_n)$.
- 51 (3) The elements in the feature set \mathbf{C}_i for $i = 1, 2, \dots, m$ are not all consistent (there are at least two different
52 elements) and not all inconsistent (there are at least two identical elements). 1) There are at least two different
53 elements. If all the elements in the feature set are the same, then the feature point is not distinguished and
54 cannot be a feature point. 2) There are at least two identical elements. If all elements in the feature set are
55 different, then the characteristic moment of all alternative branches at the feature point are $n - 1$. As a result,
56 the characteristic moment at the feature point has no effective contribution to obtain the corresponding branches
57 of $\min(L_1, L_2, \dots, L_n)$.

58 For the WeChat logo in Figure 1, the decision-making process using the ZKDM method is presented. Through
59 observation, it is found that the discrimination of the four options is mainly depicted in the following three feature
60 points: (i) the arrangement of the left and right positions of the speech bubbles; (ii) the dividing line between the
61 big bubble and the small bubble; and (iii) the mouth arc on the small bubble (a smiling face).

62 For each feature point, a feature set can be established to describe the characteristics of the four pictorial options.
63 The feature set based on the first feature point is (the small bubble is on the left and the big one is on the right),
64 (the small bubble is on the right and the big one is on the left), (the small bubble is on the right and the big one is
65 on the left), (the small bubble is on the right and the big one is on the left). The feature set based on the second
66 feature point is (there is a dividing line between the two bubbles), (there is a dividing line between the two bubbles),
67 (there is a dividing line between the two bubbles), (there is no dividing line between the two bubbles). The feature
68 set based on the third feature point is (the small bubble has no mouth arc), (the small bubble has a mouth arc), (the
69 small bubble has no mouth arc), (the small bubble has no mouth arc). For the above feature sets, the characteristic
70 moments of the four options presented in Fig. 1 for the three feature points are calculated respectively according
71 to Equation (1). The characteristic moments of the four pictures corresponding to feature points are $(3, 1, 1, 1)$,
72 $(1, 1, 1, 3)$, and $(1, 3, 1, 1)$, respectively. By summing up the characteristic moments of the above three characteristic
73 points, the characteristic moments of the system are $(5, 5, 3, 5)$. The system characteristic moment of the third
74 options is the smallest, so the decision-maker should choose option 3, and the correct answer is indeed the third
75 option.

76 This begs the following questions: (1) How universal are the cases like the above mentioned WeChat logo with
77 ZKDM? (2) How extensive is the use of the ZKDM method in situations where it is potentially adoptable? (3) Why
78 does the ZKDM method work? (4) Is the ZKDM method correct? We initiate the study of ZKDM, and provide
79 answers to these questions in Sections 2 and 3.

80 2 Methods

81 Firstly, we examine the potential use of ZKDM through a questionnaire, which has been approved by the academic
82 ethics committee of Anhui University of Technology. We confirm that all methods were carried out in accordance
83 with relevant guidelines and regulations and informed consent was obtained from all subjects. Through a series of
84 examination papers, we notice that ZKDM can be used in some cases. See Appendix for a compilation of such cases.
85 Findings from our investigation, in Appendix, also reveal that ZKDM can be adopted in events of multi-disciplinary
86 decision making, for instance, mathematics, physics, chemistry, geography, history, biology and language. Thus, this
87 method has certain universality. At the same time, cases with ZKDM also appear in the representative decision
88 making situations like the Chinese college entrance examination. This case indicates that the designers of decision-
89 making events have not yet realized (or ignored) the existence of ZKDM.

90 We conducted multiple surveys on decision-makers to elucidate the real-world extent of the use of the ZKDM
91 method. We designed two questionnaires. The first questionnaire consists a single question where respondents were
92 instructed to answer the multiple-choice question in Section 1, and the second questionnaire was to extract the reason
93 for their choice. Three options were given in the questionnaire as possible reasons: (i) I remember the real WeChat
94 logo. (ii) I choose at random and it turns out to be correct. (iii) After careful observation and thinking, I used a
95 certain decision making approach. If respondents choose the third option, they were requested to explain the ideas
96 or methods used to arrive at their choice.

97 The respondents (freshmen of Business School of Anhui University of Technology) were divided into three groups.
98 The first group was told that the questionnaire had no purpose, the second group was told that the questionnaire
99 was related to the abilities of evaluation, analysis and reasoning, and the third group was told that the questionnaire
100 was related to the selection of innovation tournament. The questionnaires of the three groups were carried out
101 simultaneously. Questionnaire 1 was conducted first. Then, the organizers checked the answers of each student,
102 and the ones who selected the correct option stayed to participate in Questionnaire 2. The processes relating to
103 the conduct of the questionnaires were performed in strict accordance with the requirements of the examination
104 discipline.

105 3 Results

106 Figures 2 and 3 present the findings of investigation of Questionnaire 1 and Questionnaire 2, respectively. In
107 response to Questionnaire 2, some keywords appear, for instance, "having similarity", "having the maximum common
108 features", "combining the most features" and "difference exclusion". The organizers screened and judged them, and
109 divided them into two categories: irrelevant and relevant to ZKDM.

110 According to the findings of investigation of Questionnaire 1, we observed that the proportions of respondents
111 who chose the correct choice in all three groups are high, 89.68%, 96.61% and 90.98%, respectively. The reason
112 may be that WeChat is widely and frequently used, and the respondents have familiarity with the correct logo. The
113 reason why the proportions in the second and third groups are higher than the one in the first group may be that
114 the respondents were informed of the purpose of the questionnaire in advance. It aroused the respondents' attention
115 to the questions in the questionnaire.

116 To elucidate the reasons for each correct response, a second questionnaire was conducted. The findings from
117 investigating the responses from Questionnaire 2 reveal that the proportion of the respondents with the correct
118 choice (that is, those who answered Questionnaire 1 correctly) in each group was 50.36%, 57.89% and 64.46% of all
119 respondents, respectively. The proportion respondents whose decision making is related to ZKDM in each group
120 accounted for 15.11%, 23.98% and 22.31% among all the respondents in Questionnaire 2; 13.55%, 23.16% and 20.30%
121 among all the respondents in each group; and 30.00%, 41.41% and 34.62% among all the respondents with the correct
122 choice in each group, respectively.

123 In the second and third groups, the proportions of respondents with the correct choice and those related to
124 ZKDM are relatively high. The reason may be related to informing the purpose of the questionnaire in advance. The
125 purposes of the abilities of "evaluation, analysis and reasoning" and the selection of "innovation tournament" have
126 played a certain motivating role for the respondents. In the third group, the proportion of respondents selecting the
127 correct option was 64.46%, higher than that of the second group, 57.89%. However, the proportion of the respondents
128 indicating hints of using ZKDM in the third group was 34.62%, lower in comparison to 41.41% in the second group.
129 The reason may be related to the different purposes informed to the two groups of questionnaires. The purpose of the
130 questionnaire of abilities of "evaluation, analysis and reasoning" may guide the respondents to make more rational
131 reasoning and thinking, so the proportion of the responses related to ZKDM in the second group is relatively higher.
132 The purpose of the questionnaire as a selection for an "innovation tournament" may guide the respondents to think
133 more creatively to showcase innovation abilities. In the responses from the third group, there are descriptions related
134 to design layout, meaning behind the logo and aesthetics. Some examples of responses given by various respondent
135 in the third group are: "the layout of big bubble on the left and small bubble on the right is pleasing to the eyes",
136 "it looks better with shadow on the edge", "according to the aesthetics of the picture, the large chat icon should
137 be in the back and the small one in the front and it is more beautiful to look from left to right in accordance with
138 the reading style", "WeChat has no meaning of smiling", "WeChat app means to provide a platform for people to
139 people to communicate, but at the same time, it will protect people's privacy. It has a sense of boundary but not
140 complete integration", "we can get closer to each other through the news from time to time, but there is still a
141 distance and will not merge", and "the person that initiates the message has a stronger desire to communicate and
142 thus has a bigger speech bubble". These diverse thoughts were reasons provided by respondents in the third group
143 for choosing the third option. However, we also caution that there may be speculators which may skew our analysis,
144 that is, the respondents who choose the right WeChat logo because of their memory or good luck, or for utilitarian
145 goal (expecting to be selected to participate in the innovation tournament), they chose the third option but wrote
146 far-fetched ideas and methods (independent of ZKDM) that embody the aspect of innovation.

147 Next, we explain the mechanism behind ZKDM, and why it works. The mechanism behind the ZKDM method
148 may be attributed to the subjective design idea of the designer of the decision event. The designer of the decision
149 event (multiple-choice questions in our case) usually first determines the correct option, and then make perturbing
150 changes to the correct option so as to design other alternative branches. Methods of making changes mainly include
151 the principle of similarity (or difference) in shape and the principle of proximity (or opposition) in meaning, and
152 this change may only be presented in a feature point. Therefore, according to this idea the core of all the selection

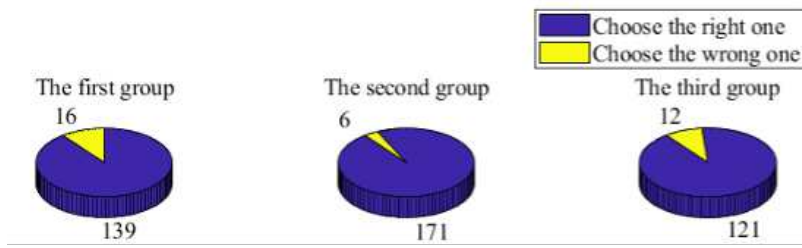


Figure 2: Statistics of the number of decision-makers, and the results in Questionnaire 1.

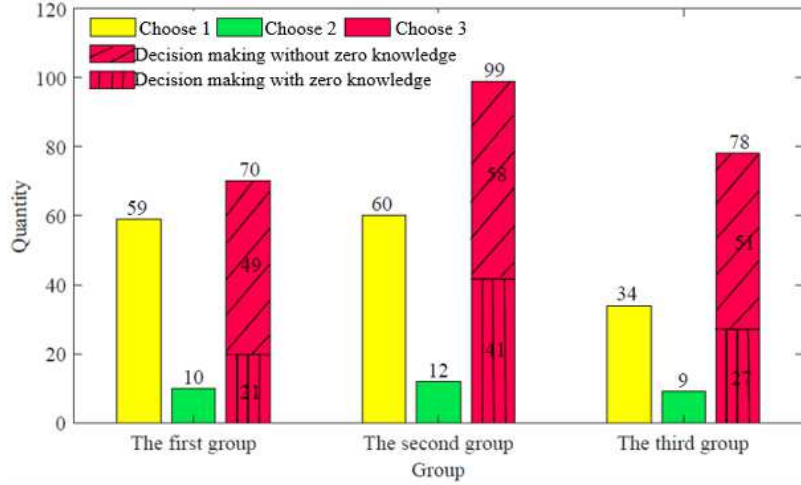


Figure 3: Statistics of the number of decision-makers in Questionnaire 2.

153 branches is the correct one, which must be the branch with the most common characteristics with other branches.
 154 The ZKDM method is just the inverse process of the above design idea, so the quantitative method can be used to
 155 establish the system characteristic moment and the selection branch with most common features can be obtained.

156 Then does the designer who uses the above design ideas to design decision events (multiple-choice questions)
 157 exist? How broad and universal is it? For this reason, we designed a questionnaire for question designers. It contains
 158 two questions: (i) When you design the selection branches of multiple-choice questions, do you first determine the
 159 correct answer? A. Yes; B. No (please write down your specific method). (ii) How do you design and determine the
 160 other choices except the correct answer? A. Subjective imagination and determination at will; B. Change the correct
 161 answer to generate other options; C. According to the wrong ideas easily induced by the investigated knowledge
 162 points, the remaining selection branches are designed; D. According to the specific situation of the exercise problems,
 163 the above methods (please check: A, B, C) have all been used; E. Use other methods to design and determine (please
 164 write down your method).

165 The results of the survey by questionnaire of 279 teachers in Anhui University of technology showed that for
 166 the first question, 274 candidates chose A and 5 candidates chose B. This result indicated that the vast majority
 167 (98.21%) of designers first decide the right choice. For the second question, 11 candidates chose A, 44 candidates
 168 chose B, 87 candidates chose C, in option D with multiple choices: 1 candidate chose A and B, 3 candidates chose A
 169 and C, 67 candidates chose B and C, 66 candidates chose A, B and C, and no one chose option E. The proportion
 170 of the number of choosing option B individually in the total number is 15.77%. The proportion of the number
 171 of candidates (178 candidates) choosing options that include option B individually and option D with option B
 172 accounted for 63.80% of the total number of candidates. The number of choosing options that includes option B
 173 (178 times) accounted for 36.93% of the total number of options (482 times). Therefore, it is common for designers
 174 to “change the correct answer to derive the remaining options”. Hence, we can extrapolate that this design method
 175 to craft selection branches for decision events can be considered universal.

176 Finally, we prove the correctness of the ZKDM method. Assume that the designer of the decision event designs
 177 the interference branches by making changes to the characteristic points of the correct branch, and the changes of
 178 each interference branch on the same characteristic point are different, we can prove that the system characteristic
 179 moment of the correct branch is the smallest and unique.

180 It is assumed that when the designer of the decision event designs the j -th interference branch, a number of h_j ,
 181 $1 \leq h_j \leq m$, feature points of the correct branch is subjected to change. A number of N_i interference branches

182 is designed based on the change of the i -th, ($i = 1, 2, \dots, m$), feature point. Since there are at least two different
 183 elements in the feature set corresponding to any feature point, $N_i \geq 1$. Furthermore, there are at least two identical
 184 elements at the same time, thus $N_i < n - 1$. According to the assumption, for the same feature point i , the elements
 185 in the feature set $\mathbf{C}_i = (C_{1i}, C_{2i}, \dots, C_{ni})$ corresponding to the interference branches are not only different from the
 186 elements of the correct branch, but also different from each other. The set of serial numbers corresponding to the
 187 number of N_i interference branches is recorded as \mathbf{S}_i . Since the interference branch only changes for one feature
 188 point of the correct branch, there exists

$$\mathbf{S}_1 \cup \mathbf{S}_2 \cup \dots \cup \mathbf{S}_m = \bar{\mathbf{S}}, \quad (4)$$

189 where $\bar{\mathbf{S}}$ is the set composed of the sequence numbers of all interference branches.

190 For the feature set \mathbf{C}_i , the feature moment of the branch with the same elements as the correct branch (including
 191 the correct branch) is N_i . For the branches with different elements from the correct branch, because they are also
 192 different from each other, the feature distance is $n - 1$. The system characteristic moment of the correct branch on
 193 all m characteristic points is $\sum_{i=1}^m N_i$. For an arbitrary interference branch $j \in \mathbf{S}_x (x \in \{1, 2, \dots, m\})$, \mathbf{S}_x represents
 194 a set containing the serial numbers of the j -th interference branch (in all, there are h_j sets of this type), and its
 195 system characteristic moment on all m characteristic points is $\sum_{i=1, i \neq x}^m N_i + h_j(n - 1)$. Since

$$N_i < n - 1 \quad (i = 1, 2, \dots, m), \quad (5)$$

196 then

$$\sum_{i=1}^m N_i = \sum_{i=1, i \neq x}^m N_i + \sum_{i=1, i=x}^m N_i < \sum_{i=1, i \neq x}^m N_i + h_j(n - 1). \quad (6)$$

197 Thus, the system characteristic moment of the correct branch is unique and the smallest.

198 The interference branch is designed by assuming that the designer of the decision event only selects to change
 199 a feature point of the correct branch. This situation is a special case under said circumstances, that is, $h_j = 1$ for
 200 all interfering branches. In this instance, $\sum_{i=1}^m N_i = n - 1$ and $\mathbf{S}_a \cap \mathbf{S}_b = \Phi (a, b \in \{1, 2, \dots, m\}; a \neq b)$ exist,
 201 where Φ is an empty set. The system characteristic moment of the correct branch on all m characteristic points is
 202 $\sum_{i=1}^m N_i = n - 1$, and the system characteristic moment of any interference branch $j \in \mathbf{S}_x (x \in \{1, 2, \dots, m\})$ on
 203 all m characteristic points is $\sum_{i=1, i \neq x}^m N_i + (n - 1)$. Since $n - 1 < \sum_{i=1, i \neq x}^m N_i + (n - 1)$, the system characteristic
 204 moment of the correct branch is unique and the smallest.

205 We can further assert that $m < n$. In addition to the correct branch, the designer of the decision event also needs
 206 to design the number of $(n - 1)$ interference branches. As each interference branch can only be changed according
 207 to one feature point of the correct branch, if $m = n$, m feature points are used to distinguish $n - 1$ interference
 208 branches. According to the Pigeonhole principle, there must be two feature points that are distinguishable on $n - 1$
 209 interference branches, so there are indeed redundant feature points.

210 4 Conclusion

211 Through data investigation, it is observed that the cases selected correctly by the ZKDM method have a certain
 212 universality. This is a practical but often overlooked feature for the designer of decision events, which allows decision-
 213 makers to arrive at the correct option using ZKDM. In the zero-knowledge decision event, the cause (all selection
 214 branches) of the decision event is the effect (the correct branch) of the effect (the changes corresponding to the correct
 215 branch) from the perspective of the event designer. From the point of view of the event decision-maker, the effect
 216 of the decision event (the correct branch) is the cause (all selection branches) of the cause (arising from the correct
 217 branch). Through a questionnaire survey of 279 event designers, the results show that more than half (63.80%) adopt
 218 the idea of “the cause is the effect of effect” in event design, indicating a high degree of universality. According to
 219 the questionnaire survey of 465 event decision-makers, 89 candidates, accounting for 19.14% in the total number, are
 220 able to use the ZKDM method to make choices. This result indicates that one in five people in the crowd has the
 221 thinking of the ZKDM. Simultaneously, the results of the questionnaire also present that there are a small number
 222 of decision-makers (4 candidates) who not only “know what it is” but also “know why it is”. This result may deduce
 223 that they make decisions from the thinking height of “the effect is the cause of cause”. For example, there are such
 224 descriptions in the questionnaire: “From a psychological point of view, options 1, 2, and 4 in Fig. 1 are all obtained
 225 by a small modification of option 3”, “There is only one difference between the interference options and the correct
 226 option”, “Option 3 has the characteristics of the other three pictures according to the rule of the question”. In
 227 addition, in the Questionnaire 2, decision-makers choosing the correct option also show a decision-making method
 228 based on memory, preference and inspire. Further, keywords like *impression, familiarity, overall similarity, memory,*
 229 *experience, intuition, feeling, unnaturalness, incongruity, symmetry, visual habit, beauty, pleasing to the eye, comfort,*
 230 *substitution sense, hierarchy sense, rationality, design principle of logo, the limit of space and time of communication,*

231 *privacy, distance sense, association* appear in the text description of ideas and practices for some respondents. For
232 these reasons, ZKDM is an important and emerging field of research in determining human behaviours in decision
233 making.

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269 Compliance with Ethical Standards

270 **Conflicts of interest:** The authors declare that they have no conflict of interest.

Supplementary Files

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